

# Ground-penetrating radar measurements of debris thickness on Lirung Glacier, Nepal

MICHAEL MCCARTHY,<sup>1,2</sup> HAMISH PRITCHARD,<sup>1</sup> IAN WILLIS,<sup>2</sup> EDWARD KING<sup>1</sup>

<sup>1</sup>British Antarctic Survey, Natural Environment Research Council, Madingley Road, Cambridge, UK

<sup>2</sup>Scott Polar Research Institute, University of Cambridge, Cambridge, UK

Correspondence: Michael McCarthy <[miccar14@bas.ac.uk](mailto:miccar14@bas.ac.uk)>

**ABSTRACT.** Supraglacial debris thickness is a key control on the surface energy balance of debris-covered glaciers, yet debris thickness measurements are sparse due to difficulties of data collection. Here we use ground-penetrating radar (GPR) to measure debris thickness on the ablation zone of Lirung Glacier, Nepal. We observe a strong, continuous reflection, which we interpret as the ice surface, through debris layers of 0.1 to at least 2.3 m thick, provided that appropriate acquisition parameters were used while surveying. GPR measurements of debris thickness correlate well with pit measurements of debris thickness ( $r = 0.91$ , RMSE = 0.04 m) and two-way travel times are consistent at tie points ( $r = 0.97$ ). 33% of measurements are <0.5 m, so sub-debris melting is likely important in terms of mass loss on the debris-covered tongue and debris thickness is highly variable over small spatial scales (of order 10 m), likely due to local slope processes. GPR can be used to make debris thickness measurements more quickly, over a wider debris thickness range, and at higher spatial resolution than any other means and is therefore a valuable tool with which to map debris thickness distribution on Himalayan glaciers.

**KEYWORDS:** debris-covered glaciers, debris thickness, ground-penetrating radar, supraglacial debris

## 1. INTRODUCTION

Supraglacial debris is a common feature of glacier ablation zones in temperate mountain ranges. In the Himalaya, where glaciers constitute an important water resource, debris covers 10–20% of total glacier area and is increasingly prevalent under current climatic conditions (Bolch and others, 2008, 2012; Scherler and others, 2011; Frey and others, 2012; Sasaki and others, 2016). Extensive debris cover promotes glacier stagnation and supraglacial lake formation, via differential melting and surface slope reduction (Reynolds, 2000; Benn and others, 2012; Mertes and others, 2016), and modifies surface mass balance response to climate forcing (Scherler and others, 2011; Gardelle and others, 2013). Debris-covered glacier mass balance does not vary systematically with elevation, as is common for debris-free glaciers (Pellicciotti and others, 2015) and debris-covered glaciers typically respond to changes in mass balance by thickening or thinning, as opposed to advancing or retreating, due to large lateral and terminal moraines and shallow surface slopes (Benn and others, 2003). The relationship between debris cover, surface mass balance and glacier evolution is complex and one of the leading uncertainties in predicting the future of high-mountain glaciers (Bolch and others, 2012).

Debris thickness has been shown to range from millimetres to metres on ablation zones in the Himalayan region (e.g. Nakawo and others, 1986; Mihalcea and others, 2008; Zhang and others, 2011; Nicholson and Benn, 2012) and has a highly non-linear relationship with sub-debris ice melt rate. Compared with debris-free ice, melt rate is high under debris thinner than the critical thickness (i.e. the thickness at which sub-debris melt rate is the same as debris-free melt rate, typically <0.1 m), due to reduced surface albedo and low under debris thicker than

the critical thickness, which acts as an insulator (Østrem, 1959; Mattson and others, 1993; Nicholson and Benn, 2006; Reznichenko and others, 2010). This relationship is described by the so-called Østrem curve. Sub-debris melting is thought to account for a considerable portion of ice melt in debris-covered catchments (Fujita and Sakai, 2014; Ragettli and others, 2015) and debris thickness is a key input to sub-debris melt models (e.g. Reid and Brock, 2010; Lejeune and others, 2013; Evatt and others, 2015) and glacio-hydrological models (e.g. Ragettli and others, 2015; Douglas and others, 2016). However, debris thickness, and its variability in both time and space, is rarely accounted for in such models due to a paucity of data resulting from data collection difficulties (e.g. Ragettli and others, 2015).

In-situ measurements of debris thickness are typically made by digging pits to the ice surface or surveying exposures above ice cliffs. In our experience, digging pits is time consuming, physically difficult, typically biased towards smaller thicknesses and yields only spatially discrete, single point measurements. Debris thickness measurements made at exposures above ice cliffs are biased because ice cliffs occur in atypical glacier surface settings (although several point measurements can be made along each exposure). Achieving adequate sampling is difficult by both methods, and inaccuracies result from interpolating between sparse measurement points. Recent studies have used thermal-band satellite imagery with meteorological data to solve an energy balance for debris thickness (Mihalcea and others, 2008; Zhang and others, 2011; Foster and others, 2012; Rounce and McKinney, 2014; Rounce and others, 2015; Schauwecker and others, 2015). However, while the energy balance approach has the potential to yield mountain-range scale debris thickness measurements, it is limited by mixed-pixel effects and has proven difficult to validate

due to a lack of in-situ debris thickness measurements at a scale comparable with the resolution of thermal-band satellite sensors (e.g. Foster and others, 2012; Rounce and McKinney, 2014; Schauwecker and others, 2015).

Radar is commonly used in glaciology to determine glacier ice thickness, internal structure and basal conditions (Plewes and Hubbard, 2001) and has been used to measure the thickness of debris-covered glaciers in New Zealand and Nepal (Nobes and others, 1994; Gades and others, 2000). Commercially available ground-penetrating radar (GPR) systems have been used to investigate a wide variety of frozen materials and glacial sediments (Neal, 2004; Woodward and Burke, 2007), including those of rock glaciers (e.g. Degenhardt and others, 2003), ice-cored moraines (e.g. Lønne and Lauritsen, 1996; Hambrey and others, 2009), talus deposits (e.g. Sass and Wollny, 2001; Sass, 2006) and permafrost (Dallimore and Davis, 1992; Brandt and others, 2007). GPR is often used to measure snow depth (e.g. Sinisalo and others, 2003; Booth and others, 2013) and has been used to measure permafrost active layer thickness at shallow depths of <1 m (e.g. Moorman and others, 2003; Bradford and others, 2005; Gusmeroli and others, 2015). Moorman and Michel (2000) used GPR to find the depth to buried ice in the proglacial environment of Bylot Island, Arctic Canada and Wu and Liu (2012) presented low operating frequency reflection profiles collected on thick debris on Koxkar Glacier, China.

Here, using Lirung Glacier, Nepal, as a test site, we assess the potential of using GPR as a quicker, more efficient and less biased method of measuring debris thickness than digging pits or surveying exposures above ice cliffs. We calculate debris thickness using manual picks of the ice surface in GPR reflection profiles and common midpoint (CMP) survey-derived wave speeds, taking the geometry of the GPR system into account and propagating the associated uncertainties. Our key objectives were to investigate the strength, continuity and polarity of the ice surface reflection through a debris layer and the different radar facies of debris and ice; to compare GPR and pit measurements of debris thickness and test for two-way travel time (TWTT) consistency at tie points; and to make measurements of debris thickness on the ablation zone of a debris-covered glacier, characterising the spatial variability of debris thickness and examining how debris thickness relates to surface topography. Although the geographic extent of our survey was somewhat limited by snow cover, these objectives were largely achieved. We show that GPR is a useful tool with which to determine debris thickness on Himalayan glaciers and present measurements of debris thickness on Lirung Glacier.

## 2. STUDY SITE

Lirung Glacier is a temperate, largely avalanche-fed valley glacier in the Nepal Himalaya (Fig. 1a), with a total area of 6.3 km<sup>2</sup> and a debris-covered area of 1.7 km<sup>2</sup>. The debris-covered area spans 4000–5300 m elevation and is dominated by a detached, debris-covered tongue, which has a low surface gradient of <10° (Pellicciotti and others, 2015). The tongue is largely stagnant (Kraaijenbrink and others, 2016) and has a highly heterogeneous, locally complex topography that supports numerous supraglacial ponds and ice cliffs (Sakai and others, 2000; Steiner and others, 2015; Miles and others, 2016). Gades and others (2000) report a debris thickness range of ~0.5 m on the upper ablation

zone to ~3 m near the terminus. Lirung Glacier debris is predominantly granitic (Reddy and others, 1993) and has a particle size range of <0.001 to >5 m.

## 3. METHODS

### 3.1. Data collection

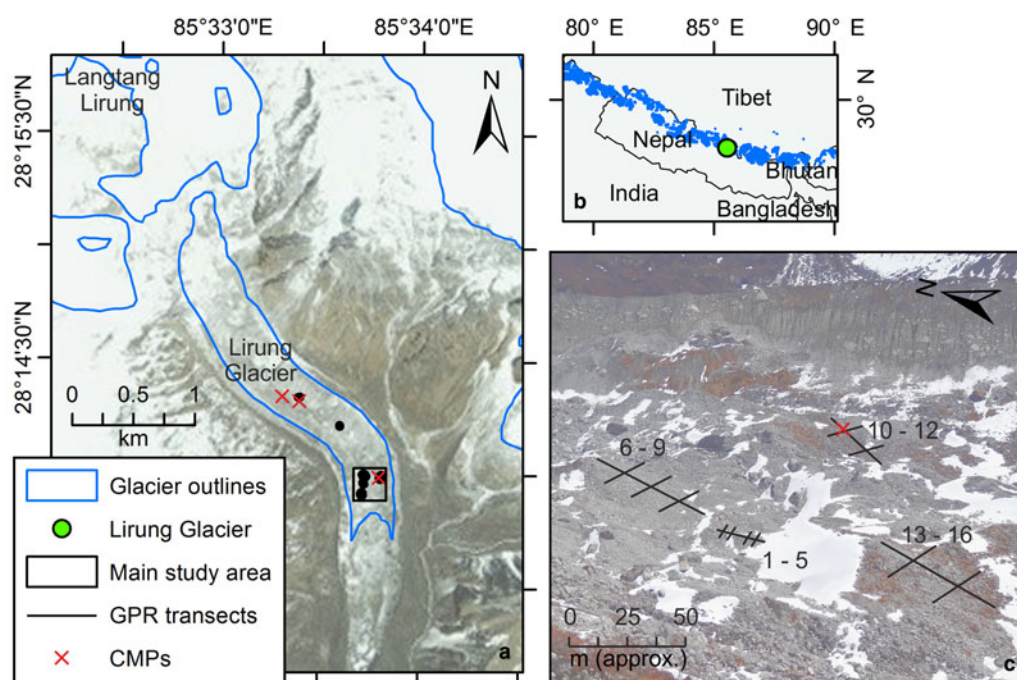
Fieldwork was carried out in March and April 2015. We collected GPR data using a Sensors and Software pulseEKKO 1000, with 225, 450, 900 and 1200 MHz antennas, varying the operating frequency until the ice surface had been successfully imaged (on the basis that attenuation and range resolution typically decrease with decreasing operating frequency; Davis and Annan, 1989). We collected 29 reflection profiles along 15 transects near the terminus (Fig. 1c) and carried out nine CMPs according to the method outlined by Jol and Bristow (2003). Operating frequency and acquisition parameters are presented in Table 1. The 15 transects crossed each other in 11 places, giving 11 tie points and were limited in length and location by patches of wet snow. We used step sizes recommended by the manufacturer (Sensors and Software, 1999), 64-fold stacking and varied the digitisation interval (sample rate) and time window depending on operating frequency and expected debris thickness (Table 1). To ensure good ground coupling and to allow measurements at individual traces to be compared with pit measurements, we collected both reflection profiles and CMPs in 'step-mode'. We located the GPR transects at 0.25 m intervals using differential global positioning system (DGPS), achieving 0.2 m vertical accuracy and 0.1 m horizontal accuracy. To validate our GPR measurements of debris thickness, we dug 34 pits, ranging from 0.16 to 0.58 m deep, through the debris to the ice surface, along seven of the transects.

### 3.2. Data quality

Data quality was found to be largely dependent on the acquisition parameters (particularly operating frequency) used during data collection (see Section 5). Poor quality reflection profiles, collected using inappropriate acquisition parameters, were ultimately discarded, and Table 1 shows, which reflection profiles were used to generate debris thickness data. We checked reflection profiles for artefacts and noise, noting that direct waves were slightly misaligned from trace to trace prior to processing, probably due to variable ground coupling. By fitting a straight line of gradient 0.3 m ns<sup>-1</sup> to direct waves in CMP plots we found, as expected, that first breaks represent the arrival of the air wave.

### 3.3. Processing

Reflection profiles were processed using REFLEXW (Sandmeier Software) according to the following steps (after Cassidy, 2009): trace editing, plateau declipping, DC shift, align first breaks at TWTT = 0, dewow, align first breaks at TWTT = antenna separation/speed of light (timezero correction), background removal, bandpass filter, gain correction. Dewow was applied after aligning first breaks at TWTT = 0 because it causes a zero phase filter precursor if applied before (Sensors and Software, 1999) and the dewow time window was set to the same length as the period of the signal of each operating frequency: 4.44, 2.22, 1.11 and



**Fig. 1.** (a) Map of Lirung Glacier on DigitalGlobe imagery. (b) Map of Lirung Glacier in the context of country borders and Himalayan glaciers. Glacier outlines are modified from RGI version 5.0. (c) Field photograph of the main study area, showing GPR transect locations in the context of snow cover and heterogeneous topography.

0.83 ns, for 225, 450, 900 and 1200 MHz antennas, respectively. For the bandpass filter, lower cut-off, lower plateau, higher plateau and higher cut-off were set to  $0.25\times$ ,  $0.5\times$ ,  $1.5\times$  and  $3\times$  peak returned frequency, respectively, in order that the width of the plateau pass was similar to the bandwidth (Davis and Annan, 1989) and the taper slope was gentle (Bristow and Jol, 2003). We chose not to apply topographic correction because the amplitude of topographic change is typically much greater than the amplitude of debris thickness change, and this was found to make interpretation of the ice surface more difficult. We chose not to apply typical gain functions because we did not use a topographic correction, and gain amplifies noise as well as features of interest. Instead, we desaturated the top of each reflection profile by applying a linear negative vertical gain from first breaks ( $-20$  dB) to  $1.5\times$  the pulse width from first breaks ( $0$  dB). Horizontal gain was applied in some cases to counter variable penetration depth. CMP data were processed similarly to reflection profiles but timezero was found by fitting a straight line ( $0.3\text{ m ns}^{-1}$ ) to the air wave onset, and we applied no background removal or gain correction. All GPR data are presented as ‘trace normalised’ to account for differences in ground coupling.

Processing significantly aided interpretation of the ice surface. In particular, background removal helped to counteract ‘transmitter blanking’ at the top of reflection profiles due to the high-energy direct wave, and bandpass filtering effectively removed high frequency noise. We note that our choice of dewow time window was possibly not optimal, because the period of the received signal is often different from that of the transmitted signal, and that using a longer time window may have yielded better results.

### 3.4. Picking

First break picks were made using the REFLEXW ‘autopick’ function, with an amplitude threshold of 0.2, and

autocorrected back in time to zero amplitude. We picked first breaks after applying the DC shift filter in order that they were not affected by DC bias.

We picked the ice surface manually at the onset of the first continuous high-amplitude reflection at depth (i.e. the first reflection below the direct wave reflection) in each reflection profile (Fig. 2). Picking was carried out blind, without reference to pit measurements, to avoid interpreter bias. We corrected ice surface picks to zero amplitude using the REFLEXW ‘autocorrect’ function and extracted their positions as TWTTs. In each reflection profile, the debris layer manifests as a high-scatter radar facies and the ice below manifests as a low-scatter radar facies (see Section 4). We used this contrast as a quality check on picks of the ice surface.

### 3.5. Wave speed analysis

We calculated debris wave speeds from CMPs by way of coherence analysis and backshifting (after Booth and others, 2010). Coherence analysis, which is similar to semblance analysis but uses a time window of the same length as the digitisation interval, facilitates assessment of the coherence of reflected waveforms across each CMP and therefore allowed the waveform associated with the ice surface to be picked confidently. Backshifting was necessary because GPR-derived depth measurements require root-mean-square wave speed rather than stacking wave speed, as given by coherence analyses, especially for short-spread conditions, where antenna separation exceeds the depth of the reflector (Booth and others, 2010).

First, ice surface waveform half-cycles were picked from coherence plots (calculated in REFLEXW) using corresponding reflection profiles as a guide (Fig. 3, left panel). These picks provided zero-offset TWTT  $t_0$  and stacking wave speed  $v_s$ . Second,  $t_0$  and  $v_s$  were substituted, with values of antenna separation  $a$ , into the normal moveout (NMO) equation (Yilmaz, 2001), to define ice surface waveform half-



**Table 1.** GPR data used in this study

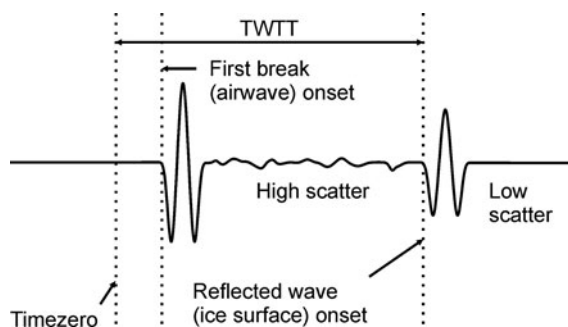
Survey type	Transect (survey) ID	Operating frequency MHz	Antenna separation m	Length m	Step size m	Digitisation interval ns	Usable (archive) data?	Comments
RP	1 (P7)	225	0.5	20	0.1	0.4	N (N)	Debris too thin
RP	1 (P6)	450	0.25	20	0.05	0.2	Y (N)	–
RP	1 (P1)	900	0.17	20	0.025	0.1	Y (Y)	–
RP	1 (P8)	1200	0.075	20	0.05	0.1	N (N)	High scatter
RP	2 (P4)	450	0.25	5	0.05	0.2	N (N)	Debris too thin
RP	2 (P2)	900	0.17	5	0.025	0.1	Y (Y)	–
RP	2 (P11)	1200	0.075	5	0.05	0.1	N (N)	High scatter
RP	3 (P5)	450	0.25	5	0.05	0.2	N (N)	Debris too thin
RP	3 (P3)	900	0.17	5	0.025	0.1	Y (Y)	–
RP	3 (P12)	1200	0.075	5	0.05	0.1	N (N)	High scatter
RP	4 (P14)	450	0.25	5	0.05	0.2	N (N)	Debris too thin
RP	4 (P9)	900	0.17	5	0.025	0.1	Y (Y)	–
RP	4 (P13)	1200	0.075	5	0.05	0.1	N (N)	High scatter
RP	5 (P15)	450	0.25	5	0.05	0.2	N (N)	Debris too thin
RP	5 (P10)	900	0.17	5	0.025	0.1	Y (Y)	–
RP	6 (P16)	225	0.5	47	0.1	0.4	N (N)	Debris too thin
RP	6 (P18)	450	0.25	47	0.05	0.2	Y (Y)	–
RP	7 (P17)	225	0.5	25	0.1	0.4	N (N)	Debris too thin
RP	7 (P19)	450	0.25	25	0.05	0.2	Y (Y)	–
RP	8 (P20)	450	0.25	25	0.05	0.2	Y (Y)	–
RP	9 (P21)	450	0.25	25	0.05	0.2	Y (Y)	–
RP	10 (P22)	225	0.5	45	0.1	0.4	N (N)	GPR low battery
RP	10 (P23)	225	0.5	45	0.1	0.4	Y (Y)	–
RP	10 (P24)	450	0.25	45	0.05	0.2	N (N)	Debris too thick
RP	11 (P25)	225	0.5	22.4	0.1	0.4	Y (Y)	High scatter
RP	12 (P26)	225	0.5	22.5	0.1	0.4	Y (Y)	High scatter
RP	13 (P27)	225	0.5	40	0.1	0.4	Y (Y)	–
RP	14 (P28)	225	0.5	20	0.1	0.4	Y (Y)	–
RP	15 (P29)	225	0.5	20	0.1	0.4	Y (Y)	–
RP	– (T14)	1200	0.75	12	0.05	0.1	Y (Y)	–
RP	– (T26)	450	0.25	10	0.05	0.2	Y (Y)	–
RP	– (T47)	225	0.5	24	0.1	0.4	N (N)	Short time window
ST	– (S30)	450	0.25	–	–	0.2	Y (N)	–
CMP	– (C4)	225	0.5	2.3	0.1	0.4	Y (N)	On P23
CMP	– (C3)	450	0.25	1	0.05	0.2	Y (N)	On T26
CMP	– (C7)	450	0.25	3	0.05	0.2	Y (N)	On T47

Survey type notation is RP, reflection profile; ST, static test; CMP, common midpoint.

cycle hyperbolas:

$$t_a = \left( t_0^2 + \frac{a^2}{v_s^2} \right)^{\frac{1}{2}} \quad (1)$$

where  $t_a$  is the TWTT at some antenna separation or ‘offset’.



**Fig. 2.** An idealised trace through a debris layer, showing first break and ice surface onset picks in relation to timezero. Debris is to the left of the ice surface onset and ice is to the right.

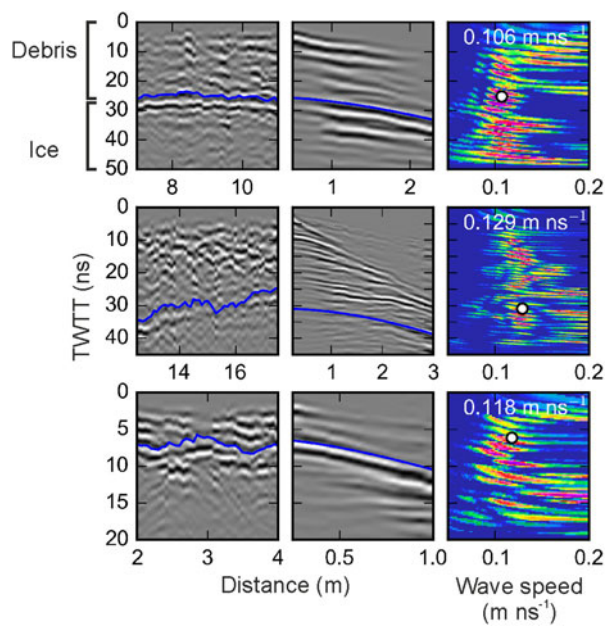
Third, a chosen hyperbola of each CMP was backshifted, according to the method outlined by Booth and others (2010), by  $\Delta t$ :

$$\Delta t = \frac{T}{4} + \frac{(HC_n - 1)T}{2} \quad (2)$$

where  $T$  is the period of the waveform and  $HC_n$  is the index number of a chosen half-cycle. Lastly, debris wave speed  $v$  was calculated from backshifted hyperbolas by rearranging the NMO equation and substituting in new values of  $t_0$  and  $t_a$  (Yilmaz, 2001):

$$v = \left( \frac{a^2}{t_a^2 - t_0^2} \right)^{\frac{1}{2}} \quad (3)$$

Analysis of three CMPs gave debris wave speeds of 0.107, 0.118 and 0.129 m ns<sup>−1</sup> (Fig. 3). Both the mean and median of these three wave speeds is 0.118 m ns<sup>−1</sup>. This is similar to wave speeds found for other glacial sediments (e.g. 0.12 m ns<sup>−1</sup>; Degenhardt and others, 2003). The remaining six



**Fig. 3.** Rows show the results of wave speed analyses performed on each of the three CMPs used to determine debris wave speed. The left-hand column shows the reflection profiles along which CMPs were collected. The middle column shows CMPs. The right-hand column shows coherence analyses. Blue lines represent the ice surface in the left-hand column and backshifted hyperbolas in the middle column. White points represent backshifted wave speeds.

CMPs were not used in wave speed analysis either because a coherent ice surface waveform was not observed or because another CMP taken in the same place with a different operating frequency produced a more coherent reflection.

### 3.6. Calculating debris thickness

We calculated debris thickness  $h$  from ice surface TWTT  $t$ , debris wave speed  $v$  and antenna separation  $a$ , thus taking system geometry into account, according to Eqn (4):

$$h = \frac{1}{2} (t^2 v^2 - a^2)^{\frac{1}{2}} \quad (4)$$

We used a wave speed of  $0.118 \text{ m ns}^{-1}$ , which is the mean and median of CMP-derived wave speeds, for all debris thickness calculations and found that correcting for system geometry is important in order to derive realistic debris thickness measurements.

### 3.7. Uncertainty estimates

We assigned uncertainty to debris thickness measurements by propagating uncertainties assigned to Eq (4) variables (assuming negligible uncertainty associated with  $a$  because pulseEKKO 1000 antenna separations are fixed and therefore subject only to manufacturing tolerances), as follows:

$$\sigma_h \approx \frac{vt}{2} (t^2 v^2 - a^2)^{-\frac{1}{2}} (v^2 \sigma_t + t^2 \sigma_v)^{\frac{1}{2}} \quad (5)$$

where  $\sigma_h$  is debris thickness uncertainty,  $\sigma_t$  is TWTT uncertainty and  $\sigma_v$  is wave speed uncertainty.

We attributed  $\sigma_t$  to two main sources: (i) misinterpretation of the ice surface due to poor data quality (we assumed the air wave was interpreted well), and (ii) the uncertainty introduced by the digitisation interval on picking first break and ice surface onsets. We assumed that we did not misinterpret the ice surface by more than one period either way (equivalent to  $\lambda/2$  in terms of thickness or range resolution; cf. Lapazaran and others, 2016) and that ice surface and first break onsets were each picked within  $1 \times$  the digitisation interval. Because these two sources of uncertainty could occur in the same instance and in the same direction,  $\sigma_t$  was calculated as:

$$\sigma_t = T + 2D \quad (6)$$

where  $D$  is the digitisation interval.

We attributed  $\sigma_v$  to the inhomogeneity (variable electromagnetic composition) of the debris, largely controlled by rock type, porosity and pore space filler (water/air/ice); debris wave speed must vary with time and space across the glacier due to variable water content and debris composition. We assumed debris wave speed varied by 10% (after Booth and others, 2010), which captures the range of wave speeds determined by the three CMPs. Note that this value would have to be much bigger if CMPs were not carried out because the theoretical wave speed range is great. We assumed no covariance between TWTT and wave speed because TWTTs were found using reflection profiles and wave speeds were found by CMP, i.e. by independent means (Pellikka and Rees, 2009).

### 3.8. Reflection power

Reflection power was calculated according to Eqn (7) (following Gades and others, 2000; Wilson and others, 2014):

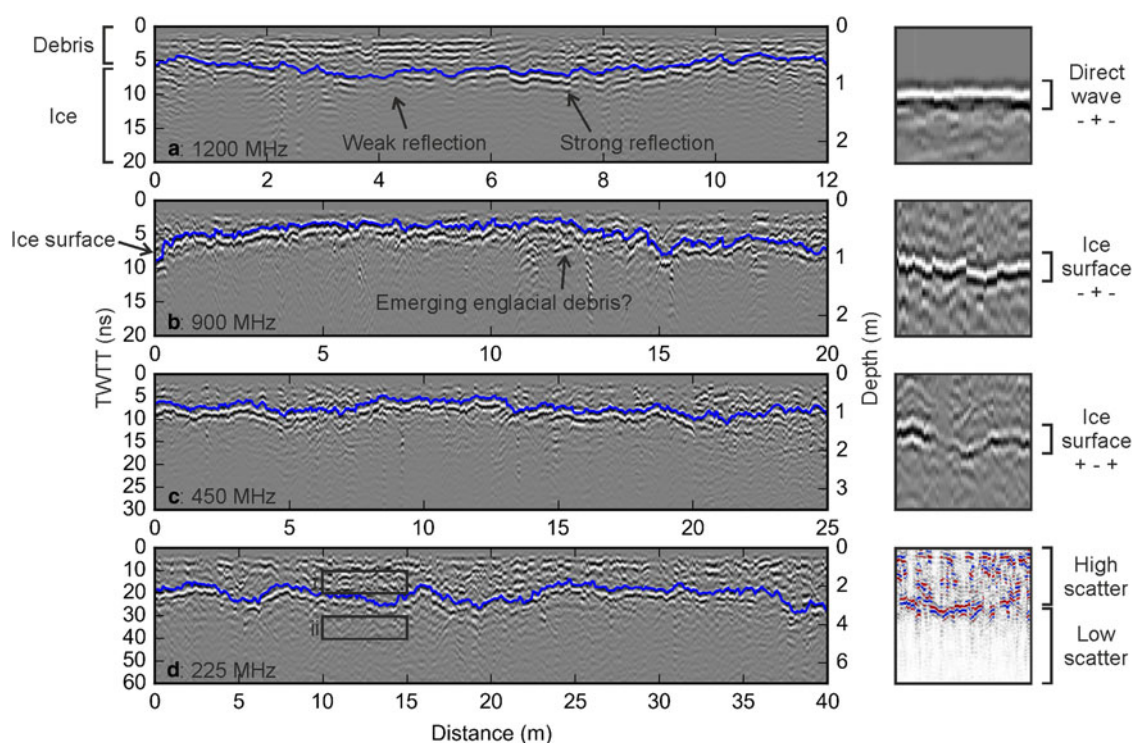
$$RP \propto \frac{1}{(t_2 - t_1 + 1)} \sum_{i=t_1}^{t_2} A_i^2 \quad (7)$$

where  $RP$  is reflection power,  $t_2$  and  $t_1$  are the sample numbers that define the time window being analysed, and  $A$  is sample amplitude. We used a time window of  $1.5T$  from the ice surface onset.

## 4. RESULTS

### 4.1. Ice surface reflection

A strong, continuous reflection occurs below the direct wave in 16 of the 29 reflection profiles collected during the main study period (Table 1). Above this reflection is a high-scatter radar facies and below it is a low-scatter radar facies. We interpret strong, continuous reflections as the ice surface (see Section 3.4), and we interpret high- and low-scatter radar facies as debris and ice, respectively (Fig. 4). Four reflection profiles showing a strong continuous reflection at the ice surface, each collected using a different operating frequency, are presented in Figure 4. Ice surface reflection power varies with distance along each reflection profile (e.g. 0.03 – Fig. 4a: weak reflection; 0.39 – Fig. 4a: strong reflection), and reflection power within the debris is typically high (e.g. 0.24 – Fig. 4d: Box i) while reflection power within the ice is typically low (e.g. 0.04 – Fig. 4d: Box ii). The polarity of the ice surface reflection is predominantly  $- + -$ ,



**Fig. 4.** Left: ice surface reflection picks (blue) on example reflection profiles in which the ice surface was successfully imaged. (a) T13, 1200 MHz. (b) P1, 900 MHz. (c) P20, 450 MHz. (d) P27, 225 MHz. Depth scales do not take system geometry into account and are therefore approximate. Right: direct wave and ice surface wavelets and the radar facies of debris and ice.

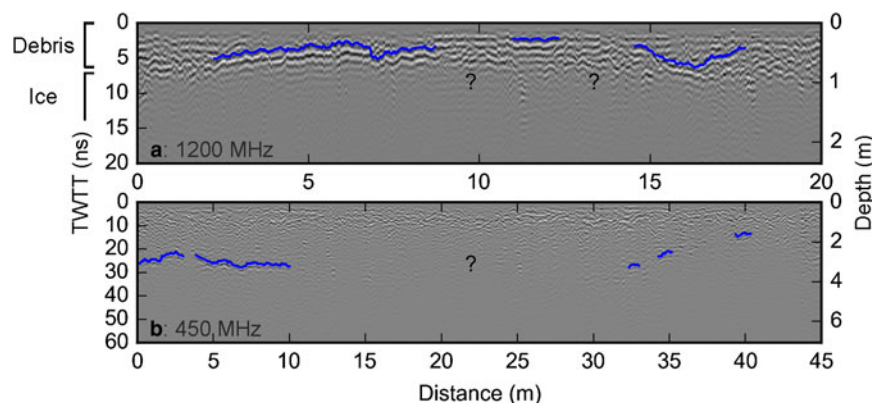
although it is sometimes reversed to  $+ - +$ . Before processing, the direct wave was seen in all reflection profiles as a continuous, high amplitude,  $- + -$  reflection.

In 13 of the 29 reflection profiles, a strong, continuous reflection is not evident (Table 1). Strong reflections occur in parts of these reflection profiles but show little continuity (e.g. Fig. 5). In places there are strong reflections at multiple depths, and some reflection profiles are dominated by noise – particularly reflection profile P8, which was collected using an operating frequency of 1200 MHz. For reflection profiles collected using each operating frequency, Table 2 shows the minimum, maximum, mean and uncertainties of all debris thickness measurements made and thus describes the measurable debris thickness range of each operating frequency. Using all four operating frequencies (225–1200 MHz), debris thickness measurements range from  $0.08 \pm 0.29$  to  $2.30 \pm 0.39$  m. We

typically only observe a strong ice surface reflection through thick debris if a low operating frequency was used and through thin debris if a high operating frequency was used. Therefore penetration depth, measurable debris thickness range and uncertainties (ranging from 0.07 to 0.39 m) are each great for low operating frequencies and small for high operating frequencies. This is shown graphically in Figure 6.

#### 4.2. Pit measurements and tie points

Debris thickness measurements made by GPR agree well with those made by digging pits to the ice surface (Fig. 7a); RMSE = 0.04 m and correlation coefficient  $r = 0.91$ . The 1:1 line lies within the 95% confidence interval of linear regression (total least squares) and hypothesis testing for slope of linear regression = 1 gives a  $P$ -value



**Fig. 5.** Reflection profiles in which the ice surface was not successfully imaged. Sections of strong ice surface reflection are marked by blue lines. (a) P8, 1200 MHz. (b) P24, 450 MHz. Depth scales do not take system geometry into account and are therefore approximate.



**Table 2.** Maximum and minimum debris thickness measurements made using each operating frequency with associated uncertainties, from all reflection profiles with usable data (Table 1)

Operating frequency MHz	$h_{\min}$ m	$h_{\max}$ m	$h_{\text{mean}}$ m	$\sigma_{\min}$ m	$\sigma_{\max}$ m	$\sigma_{\text{mean}}$ m	Pulse width ns
1200	$0.22 \pm 0.07$	$0.45 \pm 0.08$	0.35	0.07	0.08	0.07	3.8
900	$0.13 \pm 0.09$	$0.69 \pm 0.11$	0.29	0.09	0.11	0.09	4
450	$0.08 \pm 0.29$	$1.13 \pm 0.19$	0.47	0.17	0.29	0.17	5.5
225	$0.56 \pm 0.34$	$2.3 \pm 0.39$	1.28	0.34	0.39	0.34	13

Maximum, minimum, and mean uncertainties, along with pulse widths, are also provided. Also see Figure 6.

of 0.11. Pit measurements are assigned an uncertainty of  $\pm 0.05$  m. The slope of linear regression (ordinary least squares) through GPR path length vs TWTT, using the same data, gives an independent debris wave speed estimate of  $0.110 \text{ m ns}^{-1}$ .

There are 11 tie points at which transects crossed each other. At these tie points, debris thickness and therefore TWTT should be the same, allowing an independent test of wave speed variability. In this study, wave speed may have varied slightly due to variable debris water content in accordance with variable weather conditions. However, there is generally good agreement between tie point picks, as shown in Figure 7b; correlation coefficient  $r = 0.97$  and the 1:1 line lies within the 95% confidence interval of linear regression (total least squares). Hypothesis testing for slope of linear regression = 1 gives a  $P$ -value of 0.60. The maximum tie point TWTT pick is 34.0 ns ( $\sim 1.8$  m), and the minimum is 3.9 ns ( $\sim 0.2$  m). The uncertainty bars of all points are plotted here using  $\sigma_t$  only.

#### 4.3. Debris thickness and topography

Using each transect only once (where two operating frequencies were used along the same transect, data from the reflection profile with the strongest ice surface reflection were used) and after downsampling all reflection profiles to 0.1 m step size, the mean of GPR debris thickness measurements ( $n = 3558$ , from 6199 before downsampling) is 0.84 m and debris thickness ranges from  $0.11 \pm 0.23$  to  $2.30 \pm 0.39$  m. A probability density function (PDF) of debris thickness is presented in Figure 8. Data appear to fit a bimodal distribution with a positive skew towards thinner debris. Debris thickness is highly spatially variable, with a coefficient of variation of 56%. Figure 9 compares debris thickness and

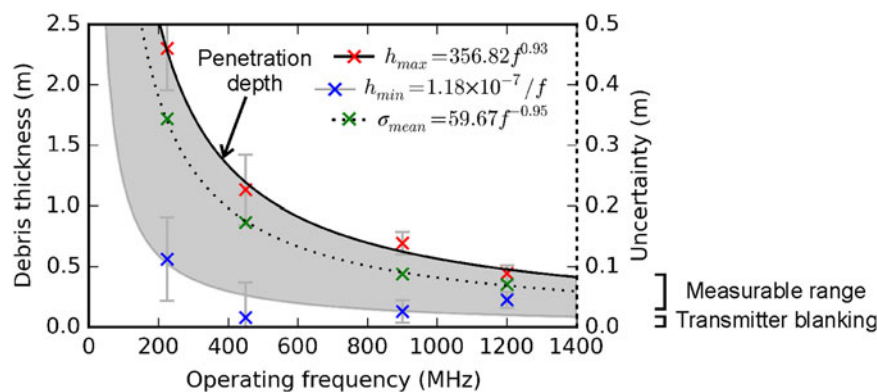
topography for a reflection profile collected on the south-facing slope of a hummock. From the top to the bottom of this slope, over a distance of 44.35 m, debris thickness increases from a minimum of  $0.11 \pm 0.23$  to a maximum of  $0.83 \pm 0.18$  m. Debris thickness data (geolocated, before downsampling) are provided in Supplementary Information (also see Table 1).

## 5. DISCUSSION

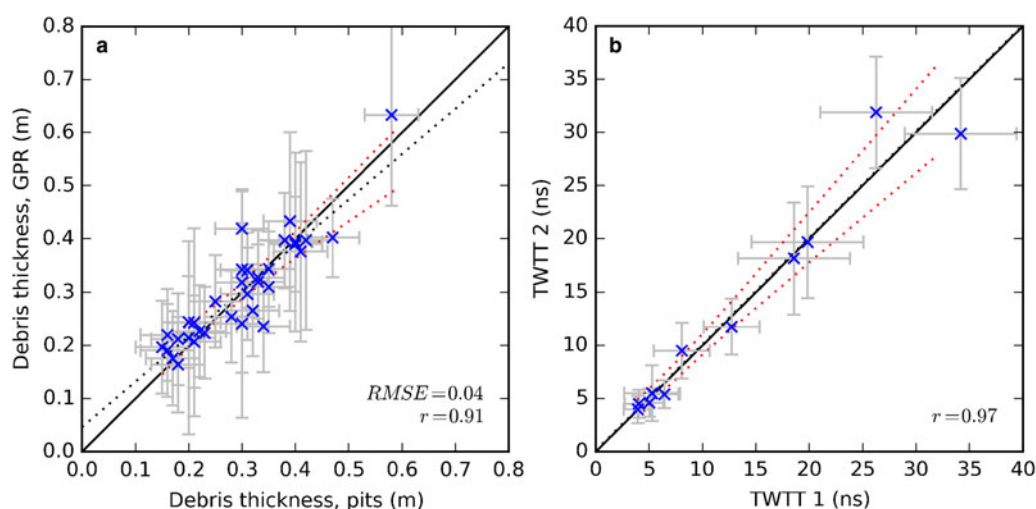
Our results confirm that GPR is a useful tool for mapping debris thickness on Himalayan glaciers and provide an insight into debris thickness variability and the nature of the ice surface during the survey period on Lirung Glacier.

### 5.1. Ice surface reflection

For each transect, at least one operating frequency produced a reflection profile showing a strong, continuous ice surface reflection. This shows that GPR can be used to image the ice surface through a debris layer, even at shallow depths of  $< 1$  m (cf. Lønne and Lauritsen, 1996; Moorman and Michel, 2000; Wu and Liu, 2012). Measurable debris thickness ranges reported in Table 2 and Figure 6 indicate that choice of operating frequency is crucial to this end. Where the chosen operating frequency was too high, attenuation prevented detection of the ice surface, e.g. Figure 5b (cf. Annan, 2009). Where the chosen operating frequency was too low, the ice surface reflection is ambiguous because it occurs in the high-energy direct wave (which is usually wider at lower operating frequencies). This has been referred to as ‘transmitter blanking’ (Annan, 2009). Regression through  $h_{\max}$  (Fig. 6) suggests penetration depth is approximately proportional to  $f^{-0.9}$ , where  $f$  is operating frequency,



**Fig. 6.** Plot of penetration depth, measurable debris thickness range, and mean uncertainty against operating frequency. The shaded region represents measurable debris thickness range.



**Fig. 7.** (a) Comparison of GPR and pit measurements of debris thickness, where uncertainties on pit measurements are  $\pm 0.05$  m. (b) Comparison of TWTTs at tie points. The solid black lines are 1:1 lines, the dotted black lines are total least-squares linear regressions, and the dotted red lines are 95% confidence intervals.

as described by Cook (1975).  $h_{\min}$  plots on the line  $h = v/f$ , where  $v$  is median debris wave speed  $0.118 \text{ m ns}^{-1}$ , suggesting transmitter blanking is typically limited to one wavelength below the debris surface. Measurable debris thickness range is wide for low operating frequencies and narrow for high operating frequencies, and uncertainty increases (largely because range resolution decreases) with decreasing operating frequency. This means a three-way trade-off exists between penetration depth, measurable debris thickness range and uncertainty (cf. Davis and Annan, 1989). If the wavelength of the GPR signal is similar to debris grain size, scattering is likely to inhibit interpretation of the ice surface, as is shown in Figure 5a.

Reflection strength is a function of the difference in relative permittivity (and therefore wave speed) of the materials either side of a reflector, where a large difference in relative permittivity results in a strong reflection (Reynolds, 2011). Reflection strength is also controlled by the attenuation of the signal as it travels to and from the reflector. As such, the variable strength of the ice surface reflection observed in some reflection profiles could represent lateral changes in:

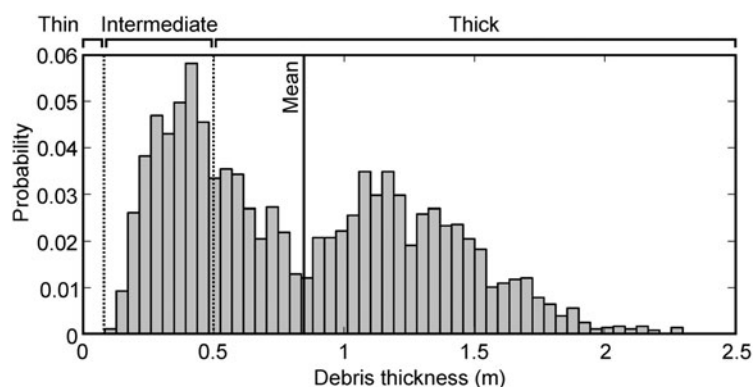
- (1) debris composition, which would cause changes in both the relative permittivity contrast at the ice surface (e.g. due to a change from wet to dry debris or vice versa)

and the rate of attenuation in the debris (e.g. due to variable clay content or large point-scatterers); or

- (2) ice surface properties (e.g. melt water, emerging englacial debris, or frozen debris on the ice surface, as opposed to a sharp debris/ice interface), which would also cause changes in the relative permittivity contrast at the ice surface.

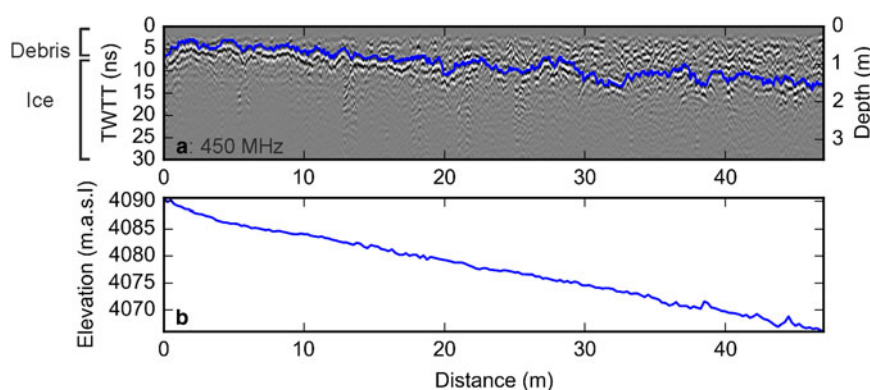
In particular, a high debris clay or water content should result in a weaker ice surface reflection due to increased attenuation, while a layer of meltwater at the ice surface should give a stronger reflection due to an increased relative permittivity contrast. Despite the variable strength of the ice surface reflection in some reflection profiles, it can often be interpreted confidently due to its continuity.

The continuity of the reflection from any non-horizontal subsurface reflector is largely determined by step size, where small steps give a more continuous reflection than large steps (Jol and Bristow, 2003). Our data were collected in 'step-mode' in order that individual traces could be matched to pit measurements of debris thickness. The step size we used was generally small enough to result in a continuous ice surface reflection. However, a high-resolution, 'continuous-mode' survey would likely yield greater continuity still. Penetration depth was limited throughout the study,



**Fig. 8.** A probability density function of debris thickness measurements after downsampling ( $n = 3558$ ).





**Fig. 9.** Comparison of (a) reflection profile P18, 450 MHz, where the blue line represents ice surface reflection picks and (b) DGPS measurements of elevation along P18, recorded every 0.25 m. The depth scale of (a) does not take system geometry into account and is therefore approximate.

likely because the debris had high water and clay content. We note that the thickest debris we encountered was  $2.30 \pm 0.39$  m and produced a strong reflection at 225 MHz frequency. Debris and ice are apparent in all reflection profiles as distinctly different radar facies, where debris is seen as a high-scatter radar facies and ice is seen as a low-scatter radar facies. This is likely due largely to the different electromagnetic properties of the different materials (debris comprises heterogeneous point-scatterers while ice is relatively homogenous) and was helpful with regard to interpreting the ice surface.

The polarity of a reflection depends on the sign of its relative permittivity contrast relative to the sign of the previous reflector's relative permittivity contrast, with the sign being negative if relative permittivity contrast is high to low and positive if low to high. If the sign is the same as that of the previous reflector, the polarity of the previous reflection is conserved. If the sign is opposite, the polarity of the previous reflection is reversed (Arcone and others, 1995). In this

study, where the direct wave is  $- + -$  and represents the passage of the signal from air to debris (a low to high, positive sign, permittivity contrast) we expect the polarity of the reflection due to the passage of the signal from debris to ice (a high to low, negative sign, permittivity contrast) to be reversed, i.e.  $+ - +$ . Instead we see the ice surface reflection as  $- + -$ , which indicates the existence of a layer of a high permittivity material at the ice surface.

To understand why observed ice surface polarity is different from expected, we modelled the ice surface response to a synthetic, 900 MHz GPR signal (kuepper wavelet) under four sets of theoretical subsurface conditions (Fig. 10):

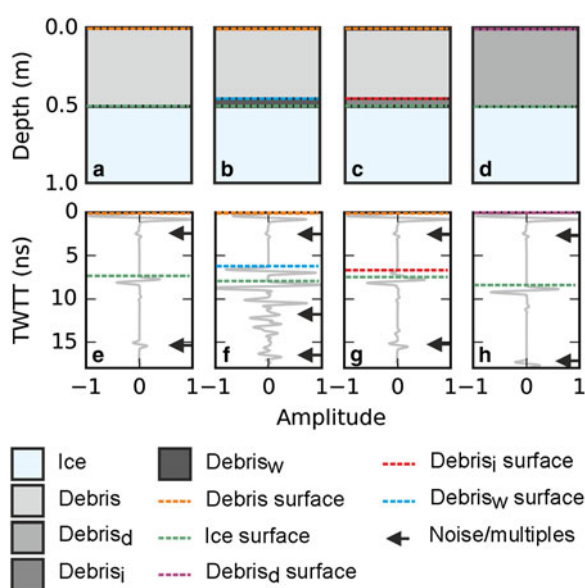
- (1) 0.01 m air over 0.49 m dry debris over ice,
- (2) 0.01 m air over 0.44 m dry debris over 0.05 m wet debris over ice,
- (3) 0.01 m air over 0.44 m dry debris over 0.05 m icy debris over ice, and
- (4) 0.01 m air over 0.49 m damp debris over ice,

using the REFLEXW 'modelling' module. We calculated the bulk relative permittivity of layers of dry, damp, wet and icy debris, using Eqn (7) (the Complex Refractive Index Model; Roth and others, 1990):

$$\epsilon_b = (\theta_{w,i} \epsilon_{w,i}^\alpha + (1 - \eta) \epsilon_r^\alpha + (\eta - \theta_{w,i}) \epsilon_a^\alpha)^{\frac{1}{\alpha}} \quad (8)$$

where  $\epsilon_b$  is bulk relative permittivity and the relative permittivities of air, water, ice and rock are  $\epsilon_a$ ,  $\epsilon_w$ ,  $\epsilon_i$  and  $\epsilon_r$  respectively.  $\eta$  is porosity, as a volume fraction of the debris and  $\alpha$  is the orientation of the electrical field induced by the transmitted signal, with respect to the internal geometry of the debris. Water or ice content as a volume fraction of the debris is  $\theta$ . We used typical relative permittivity values of  $\epsilon_a = 1$ ,  $\epsilon_w = 81$  and  $\epsilon_i = 3.2$ , after Reynolds (2011). We assumed a permittivity of 6.5 for  $\epsilon_r$ , given that Lirung Glacier debris is granitic (Reddy and others, 1993) and a debris porosity of 0.3 (Conway and Rasmussen, 2000). We assumed the debris is isotropic, so  $\alpha$  is 0.5 (Alharthi and Lange, 1987). We assumed low-loss conditions, i.e. there is no attenuation and specify that the pore spaces of wet and dry debris are saturated with water and ice, respectively. Damp debris pore space comprised 20% water and 80% air.

Modelled ice surface reflections shown in Figures 10b, c (dry debris over wet debris over ice and dry debris over icy debris over ice) show a  $- + -$  sign reflection, similar to what we observe in reflection profiles. This could suggest



**Fig. 10.** Top row: schematic of four modelled sets of subsurface conditions: (a) 0.01 m air over 0.49 m dry debris over ice. (b) 0.01 m air over 0.44 m dry debris over 0.05 m wet debris over ice. (c) 0.01 m air over 0.44 m dry debris over 0.05 m icy debris over ice. (d) 0.01 m air over 0.49 m damp debris over ice. Bottom row: modelled GPR traces, where (e) corresponds with (a), etc.

that the ice surface was typically melting during the survey period or was wet from percolating snowmelt. Alternatively, we might expect that the ice surface was not melting but that there was typically a layer of icy debris above the ice surface, maybe due to a high englacial debris content or the existence of a layer of refrozen meltwater at the ice surface. Both melt water and refrozen meltwater were observed at the ice surface while digging pits.

## 5.2. Pit measurements and tie points

We were able to dig pits through  $0.16\text{--}0.58 \pm 0.05$  m of debris to the ice surface. Digging to greater depths was not possible due to time and labour constraints, so our pit measurements are biased towards shallower depths. Pit measurements of debris thickness show a good fit to GPR measurements of debris thickness (Fig. 7a) and the 1:1 line lies within the 95% confidence interval of linear regression. This indicates that the ice surface can be reliably interpreted as distinct from processing artefacts or multiples of the debris surface and that GPR can realistically be used to measure debris thickness accurately at least in the range  $0.16\text{--}0.58$  m (cf. Moorman and Michel, 2000; Moorman and others, 2003; Bradford and others, 2005; Gusmeroli and others, 2015). The spread of data around the 1:1 line likely represents a combination of picking imprecision and spatio-temporal wave speed variability, and outliers on linear regression are assumed to be mispicks of the ice surface, where the reflections picked are artefacts of processing or the physical expression of some other subsurface feature, for example an off-nadir reflector. The calculated correlation coefficient  $r = 0.91$  is similar to that of other GPR method validation studies in similar environments (e.g. Machguth and others, 2006;  $r = 0.92$ ), and the good fit of the data suggests that both CMP-derived debris wave speeds and uncertainty estimates are realistic. The wave speed estimate of  $0.110 \text{ m ns}^{-1}$ , which was calculated from the gradient of linear regression through path length vs TWTT, is similar to CMP-derived wave speeds (within 10% uncertainty), suggesting debris wave speed did not vary much during the main study period, and is also similar to those found for other glacial sediments (e.g.  $0.12 \text{ m ns}^{-1}$ ; Degenhardt and others, 2003). It is possible that GPR measurements of debris thickness are offset from pit measurements by sideswipe or due to a layer of wet debris on the ice surface while surveying.

Despite relatively few data points, the close fit of tie points to the 1:1 line (Fig. 7b) indicates consistent interpretation of the ice surface and an absence of processing artefacts or multiples of the debris surface. It suggests that GPR can be used to measure debris thickness precisely, at least in the debris thickness range  $\sim 0.2$  to  $\sim 1.8$  m, covered by the tie points. The 1:1 line lies within the 95% confidence interval of linear regression, suggesting the uncertainties assigned to TWTT are appropriate.

## 5.3. Debris thickness and topography

The debris thickness data presented here (Fig. 8) are thinner than those of Gades and others (2000), who estimated a debris thickness range  $\sim 0.5$  m below the headwall to  $\sim 3$  m near the terminus and Ragetti and others (2015), who made ground-based observations of debris thickness across a similar area and found that in 93% of cases debris thickness was  $> 0.5$  m (here 33% of measurements are  $< 0.5$  m). We

observe a debris thickness distribution that is bimodal and positively skewed towards thinner debris. The discrepancy between our measurements and those of earlier studies, and the bimodality of the PDF in Figure 8, might partly reflect the limited spatial coverage of our measurements. However, it is likely that the positive skew is real, and we hypothesise that debris thickness would fit a lognormal or Weibull distribution if further measurements were to be made (e.g. Nicholson and Benn, 2012; Reid and others, 2012).

Rana and others (1998) and Tangborn and Rana (2000) showed that maximum sub-debris melt rate on Lirung Glacier occurs where debris is 0.03 m thick and that the critical thickness is 0.08 m. As such, our data show that debris almost as thin as the critical thickness is present near the terminus of Lirung Glacier. From the thickness at which sub-debris melt rate is maximum to  $\sim 0.5$  m, debris cover has an increasingly insulating effect on melt rate (Nicholson and Benn, 2006), so if we classify thin debris as that which is thinner than the critical thickness, thick debris as that which is thicker than 0.5 m, and intermediate debris as that which is between thick and thin, 33% of measurements are intermediate and 67% are thick. On this basis, sub-debris melting, as well as englacial conduit collapse and melting at ice cliffs and ponds (e.g. Basnett and others, 2013; Immerzeel and others, 2014; Steiner and others, 2015; Miles and others, 2016), is likely important in terms of mass loss on the debris-covered tongue.

For an idealised debris-covered glacier in steady state, with no debris input from avalanches, debris thickness on the ablation zone is controlled by englacial debris content, melt rate and surface velocity (Nakawo and others, 1986) and increases systematically down-glacier (Konrad and Humphrey, 2000). Figure 9 shows that at small scales (of order 10 m) there is likely a link between debris thickness and topography; debris is thinner on the flank than at the base of the hummock, indicating redistribution by slope processes. Because variable debris thickness causes differential melting and differential melting causes variable surface lowering, there is likely a feedback between debris thickness and surface topography (e.g. Nicholson and Benn, 2012; Reid and others, 2012). We suggest that slope processes are affecting debris thickness variability at a local scale and, in turn, that debris thickness variability is an important control on the surface evolution of the glacier, whereby high debris thickness variability promotes the development of hummocky topography, lakes, and ice cliffs and vice versa. We suggest that variable debris thickness explains some of the highly variable surface lowering observed on the ablation zone of Lirung Glacier by Immerzeel and others (2014) and Pellicciotti and others (2015).

## 5.4. Technical issues and recommendations

The highly variable topography and rough surfaces of debris-covered glaciers can make carrying out GPR surveys physically difficult and time consuming. Despite this, GPR offers significant benefits over alternative methods of measuring debris thickness; GPR is much quicker than digging pits, less biased than measuring debris thickness at ice cliffs and allows a wide debris thickness range to be measured at high spatial resolution. Jol and Bristow (2003) make general

recommendations for a successful GPR survey, many of which were found to be very useful in carrying out this work. With respect to measuring debris thickness, we recommend:

- (1) Surveys should be carried out in snow-free conditions to permit a strong ice surface reflection. Long transects should be set up where possible, in order to make the ice surface easier to interpret.
- (2) An appropriate multi-frequency GPR could be used to cover most debris thickness eventualities, significantly reducing survey time. Figure 6 can be used as a guide to choosing acquisition parameters. Collecting GPR data in 'continuous-mode' would likely result in a clearer reflection at the ice surface in areas where the debris surface is relatively smooth.
- (3) GPR should be used in conjunction with pits or CMPs in order to determine debris wave speed to make realistic debris thickness calculations. Topographic correction using DGPS measurements does not significantly improve ice surface interpretability.
- (4) Transmitter blanking limits the use of GPR for measuring the thickness of thin debris ( $<0.1$  m), where pits are more appropriate.

Future work should aim to carry out more extensive GPR surveys on the ablation zones of other debris-covered glaciers in order to better characterise debris thickness variability and to test remote sensing approaches to mapping debris thickness. The relationship between debris thickness and local surface topography should be investigated further.

## 6. CONCLUSIONS

We test the use of GPR for measuring debris thickness on Lirung Glacier, Nepal, accounting for the geometry of the GPR system and propagating the associated uncertainties. Reflection profiles show a strong, continuous reflection at the ice surface in the debris thickness range tested, provided that appropriate acquisition parameters were used during data collection. GPR measurements of debris thickness correlate well with pit measurements and TWTTs show good agreement at tie points. With respect to acquisition parameters, a three-way trade-off exists between penetration depth, measurable debris thickness range and uncertainty, where high operating frequencies are suitable for thinner debris and low operating frequencies are suitable for thicker debris. Debris wave speed ( $0.107\text{--}0.129\text{ m ns}^{-1}$ ) was surprisingly invariable during the survey period, and penetration depth through the debris was limited (max.  $2.30 \pm 0.39$  m at 225 MHz). Debris presents as a high-scatter radar facies while ice presents as low-scatter.

Debris almost as thin as the critical thickness is present near the terminus of Lirung Glacier and debris thickness is highly variable over small spatial scales (of order 10 m), ranging from  $0.11 \pm 0.23$  to  $2.30 \pm 0.39$  m with a coefficient of variation of 56%. 33% of our debris thickness measurements are  $<0.5$  m, which would suggest that sub-debris melting is important on the ablation zone of Lirung Glacier. Debris thickness appears to vary with slope, indicating redistribution by slope processes, and we suggest that variable debris thickness is a cause of variable surface lowering and therefore debris cover redistribution (and debris thickness change) on Lirung Glacier. The polarity of ice surface

reflections is commonly  $- + -$ , indicating wet or icy debris at the ice surface during the survey period.

We conclude that GPR can be used to measure debris thickness more quickly than digging pits, which are typically limited to thicknesses  $<1$  m, and allows more extensive sampling than surveying debris exposures along ice cliffs. As such, it is a valuable tool with which to map debris thickness distribution. Key limitations are the subjectivity of manual picks of the ice surface, the narrow debris thickness range for which each operating frequency can be used and the typically rough nature of debris-covered glacier surfaces. We find that system geometry is an important consideration if the ice surface is shallow compared with antenna separation and that debris wave speed must be measured (using CMPs or pits) to derive accurate debris thickness measurements. Figure 6 is potentially useful as a guide to choosing appropriate acquisition parameters for a GPR survey of debris thickness and we suggest that future work should use GPR to test or calibrate methods of mapping debris thickness using satellite imagery.

## SUPPLEMENTARY MATERIAL

To view supplementary material for this article, please visit <https://doi.org/10.1017/jog.2017.18>

## ACKNOWLEDGEMENTS

We sincerely thank Adam Booth and one anonymous reviewer, whose comments and suggestions helped improve and clarify this manuscript. M.M. is funded by NERC DTP grant number: NE/L002507/1, receives CASE funding from Reynolds International Ltd, and was provided travel support by the Jesus College Doctoral Research Fund. I.W. was funded by the BB Roberts Fund, University Travel Fund and St Catharine's College Research Fund. Equipment (GPR and DGPS) was provided under NERC Geophysical Equipment Facility grant number: 1014.

## REFERENCES

- Alharthi A and Lange J (1987) Soil water saturation: dielectric determination. *Water Resour. Res.*, **23**(4), 591–595
- Annan AP (2009) Electromagnetic principles of ground penetrating radar. In Jol HM ed. *Ground penetrating radar theory and applications*. Elsevier, Amsterdam, 3–40
- Arcone SA, Lawson DE and Delaney AJ (1995) Short-pulse radar wavelet recovery and resolution of dielectric contrasts within englacial and basal ice of Matanuska Glacier, Alaska, USA. *J. Glaciol.*, **41**(137), 68–86
- Basnett S, Kulkarni A and Bolch T (2013) The influence of debris cover and glacial lakes on the recession of glaciers in Sikkim Himalaya, India. *J. Glaciol.*, **59**(218), 1035–1046 (doi: 10.3189/2013JoG12J184)
- Benn DI, Kirkbride MP, Owen LA and Brazier V (2003) *Glaciated valley landsystems*. Arnold, London (doi: 10.4324/9780203784976)
- Benn DI and 9 others (2012) Response of debris-covered glaciers in the Mount Everest region to recent warming, and implications for outburst flood hazards. *Earth-Science Rev.*, **114**(1–2), 156–174 (doi: 10.1016/j.earscirev.2012.03.008)
- Bolch T, Buchroithner M, Pieczonka T and Kunert A (2008) Planimetric and volumetric glacier changes in the Khumbu Himal, Nepal, since 1962 using Corona, Landsat TM and ASTER data. *J. Glaciol.*, **54**(187), 592–600 (doi: 10.3189/002214308786570782)



- Bolch T and 11 others (2012) The State and Fate of Himalayan Glaciers. *Science* (80-.), **336**(6079), 310–314 (doi: 10.1126/science.1215828)
- Booth AD, Clark R and Murray T (2010) Semblance response to a ground-penetrating radar wavelet and resulting errors in velocity analysis. *Near Surf. Geophys.*, **8**(3), 235–246 (doi: 10.3997/1873-0604.2010008)
- Booth AD and 5 others (2013) A comparison of seismic and radar methods to establish the thickness and density of glacier snow cover. *Ann. Glaciol.*, **54**(64), 73–82 (doi: 10.3189/2013AoG64A044)
- Bradford JH, McNamara JP, Bowden W and Gooseff MN (2005) Measuring thaw depth beneath peat-lined Arctic streams using ground-penetrating radar. *Hydrol. Process.*, **19**(14), 2689–2699 (doi: 10.1002/hyp.5781)
- Brandt O, Langley K, Kohler J and Hamran SE (2007) Detection of buried ice and sediment layers in permafrost using multi-frequency Ground Penetrating Radar: a case examination on Svalbard. *Remote Sens. Environ.*, **111**(2), 212–227 (doi: 10.1016/j.rse.2007.03.025)
- Bristow CS and Jol HM (eds) (2003) *Ground penetrating radar in Sediments*. Geological Society of London, London
- Cassidy N (2009) Ground penetrating radar data processing, modelling and analysis. In Jol HM ed. *Ground penetrating radar theory and applications*. Elsevier, Amsterdam, 141–176
- Conway H and Rasmussen LA (2000) Summer temperature profiles within supraglacial debris on Khumbu Glacier, Nepal. *Debris-Covered Glaciers.*, IAHS Publication **264**, 89–97
- Cook JC (1975) Radar transparencies of mine and tunnel rocks. *Geophysics*, **40**(5), 865–885 (doi: 10.1190/1.1440573)
- Dallimore DR and Davis JL (1992) Ground penetrating radar investigations of massive ground ice. *Geol. Surv. Canada*, **90–4**, 41–48
- Davis JL and Annan AP (1989) Ground-penetrating radar for high-resolution mapping of soil and rock stratigraphy. *Geophys. Prospect.*, **37**(May 1988), 531–551 (doi: 10.1111/j.1365-2478.1989.tb02221.x)
- Degenhardt JJ, Giardino JR and Junck MB (2003) GPR survey of a lobate rock glacier in Yankee Boy Basin, Colorado, USA. *Geol. Soc. London, Spec. Publ.*, **211**(1), 167–179 (doi: 10.1144/GSL.SP.2001.211.01.14)
- Douglas JS, Huss M, Swift DA, Jones JM and Salerno F (2016) Incorporating distributed Debris thickness in a Glacio-Hydrological Model: Khumbu Himalaya, Nepal. *Cryosph. Discuss.*, **0**, 1–35 (doi: 10.5194/tc-2016-116)
- Evatt GW and 7 others (2015) Glacial melt under a porous debris layer. *J. Glaciol.*, **61**(229), 825–836 (doi: 10.3189/2015JogG14J235)
- Foster LA, Brock BW, Cutler MEJ and Diotri F (2012) A physically based method for estimating supraglacial debris thickness from thermal band remote-sensing data. *J. Glaciol.*, **58**(210), 677–691 (doi: 10.3189/2012JogG11J194)
- Frey H, Paul F and Strozzi T (2012) Compilation of a glacier inventory for the western Himalayas from satellite data: methods, challenges, and results. *Remote Sens. Environ.*, **124**, 832–843 (doi: 10.1016/j.rse.2012.06.020)
- Fujita K and Sakai A (2014) Modelling runoff from a Himalayan debris-covered glacier. *Hydrol. Earth Syst. Sci.*, **18**(7), 2679–2694 (doi: 10.5194/hess-18-2679-2014)
- Gades A, Conway H, Nereson N, Naito N and Kadota T (2000) Radio echo-sounding through supraglacial debris on Lirung and Khumbu Glaciers, Nepal Himalayas. *Debris-Covered Glaciers.*, IAHS Publication **264**, 13–22
- Gardelle J, Berthier E, Arnaud Y and Kääb A (2013) Region-wide glacier mass balances over the Pamir-Karakoram-Himalaya during 1999–2011. *Cryosphere*, **7**(4), 1263–1286 (doi: 10.5194/tc-7-1263-2013)
- Gusmeroli A and 5 others (2015) Active layer stratigraphy and organic layer thickness at a thermokarst site in Arctic Alaska identified using ground penetrating radar. *Arctic, Antarct. Alp. Res.*, **47**(2), 195–202 (doi: 10.1657/AAAR00C-13-301)
- Hambrey MJ and 5 others (2009) Sedimentological, geomorphological and dynamic context of debris-mantled glaciers, Mount Everest (Sagarmatha) region, Nepal. *Quat. Sci. Rev.*, **28**(11–12), 1084 (doi: 10.1016/j.quascirev.2009.04.009)
- Immerzeel WW and 6 others (2014) High-resolution monitoring of Himalayan glacier dynamics using unmanned aerial vehicles. *Remote Sens. Environ.*, **150**, 93–103 (doi: 10.1016/j.rse.2014.04.025)
- Jol HM and Bristow CS (2003) Ground penetrating radar in sediments: advice on data collection, basic processing and interpretation, a good practice guide. *Ground Penetrating Radar in Sediments.*, **211**, 9–28 (doi: 10.1144/GSL.SP.2001.211.01.02)
- Konrad SK and Humphrey NF (2000) Steady-state flow model of debris-covered glaciers (rock glaciers). *Debris-Covered Glaciers.*, IAHS Publication **264**, 255–266
- Kraaijenbrink P and 5 others (2016) Seasonal surface velocities of a Himalayan glacier derived by automated correlation of unmanned aerial vehicle imagery. *Ann. Glaciol.*, **57**(71), 103–113 (doi: 10.3189/2016AoG71A072)
- Lapazaran JJ, Otero J, Martín-Español A and Navarro FJ (2016) On the errors involved in ice-thickness estimates II: errors in digital elevation models of ice thickness. *J. Glaciol.*, **62**(236), 1–9 (doi: 10.1017/jog.2016.94)
- Lejeune Y, Bertrand J, Wagnon P and Morin S (2013) A physically based model of the year-round surface energy and mass balance of debris-covered glaciers. *J. Glaciol.*, **59**(214), 327–344 (doi: 10.3189/2013JogG12J149)
- Lønne I and Lauritsen T (1996) The architecture of a modern push-moraine at Svalbard as inferred from ground-penetrating radar measurements. *Arct. Alp. Res.*, **28**(4), 488–495
- Machguth H, Eisen O, Paul F and Hoelzle M (2006) Strong spatial variability of snow accumulation observed with helicopter-borne GPR on two adjacent Alpine glaciers. *Geophys. Res. Lett.*, **33**(13) (doi: 10.1029/2006GL026576)
- Mattson LE, Gardner JS and Young GJ (1993) Ablation on debris covered glaciers: an example from the Rakhiot Glacier, Punjab, Himalaya. Young JG ed. *Snow and glacier hydrology.*, IAHS Publication. **218**, 289–296
- Mertes JR, Thompson SS, Booth AD, Gulley JD and Benn DI (2016) A conceptual model of supra-glacial lake formation on debris-covered glaciers based on GPR facies analysis. *Earth Surf. Process. Landforms*, (doi: 10.1002/esp.4068)
- Mihalcea C and 7 others (2008) Spatial distribution of debris thickness and melting from remote-sensing and meteorological data, at debris-covered Baltoro glacier, Karakoram, Pakistan. *Ann. Glaciol.*, **48**(1), 49–57 (doi: 10.3189/172756408784700680)
- Miles ES and 5 others (2016) Refined energy-balance modelling of a supraglacial pond, Langtang Khola, Nepal. *Ann. Glaciol.*, **57**(71), 29–40 (doi: 10.3189/2016AoG71A421)
- Moorman BJ and Michel FA (2000) The burial of ice in the proglacial environment on Bylot Island, Arctic Canada. *Permafr. Periglac. Process.*, **11**(3), 161–175 (doi: 10.1002/1099-1530(200007/09)11:3<161::AID-PPP347>3.0.CO;2-F)
- Moorman BJ, Robinson SD and Burgess MM (2003) Imaging periglacial conditions with ground-penetrating radar. *Permafr. Periglac. Process.*, **14**(4), 319–329 (doi: 10.1002/ppp.463)
- Nakawo M, Iwata S and Yoshida M (1986) Processes which distribute supraglacial debris on the Khumbu Glacier, Nepal Himalaya. *Ann. Glaciol.*, **8**, 129–131
- Neal A (2004) Ground-penetrating radar and its use in sedimentology: principles, problems and progress. *Earth-Science Rev.*, **66** (3–4), 261–330 (doi: 10.1016/j.earscirev.2004.01.004)
- Nicholson L and Benn DI (2006) Calculating ice melt beneath a debris layer using meteorological data. *J. Glaciol.*, **52**(178), 463–470 (doi: 10.3189/172756506781828584)
- Nicholson L and Benn DI (2012) Properties of natural supraglacial debris in relation to modelling sub-debris ice ablation. *Earth Surf. Process. Landforms*, **38**(5), 490–501 (doi: 10.1002/esp.3299)
- Nobes D, Leary S, Hochstein M and Henry S (1994) Ground-penetrating radar profiles of rubble-covered temperate glaciers:

- results from the Tasman and Mueller glaciers of the Southern Alps of New Zealand. SEG Tech. Prog. Expanded Abstracts 1994. Society of Exploration Geophysicists, Tulsa, pp. 826–829 (doi: 10.1190/1.1932012)
- Østrem G (1959) Ice melting under a thin layer of moraine, and the existence of ice cores in moraine ridges. *Geogr. Ann.*, **41**(4), 228–230
- Pellicciotti F and 5 others (2015) Mass-balance changes of the debris-covered glaciers in the Langtang Himal, Nepal, from 1974 to 1999. *J. Glaciol.*, **61**(226), 373–386 (doi: 10.3189/2015JoG13J237)
- Pelikka P and Rees WG (2009) *Remote sensing of glaciers: techniques for topographic, spatial, and thematic mapping of glaciers*. CRC Press, Leiden
- Plewes LA and Hubbard B (2001) A review of the use of radio-echo sounding in glaciology. *Prog. Phys. Geogr.*, **25**(2), 203–236 (doi: 10.1177/030913330102500203)
- Ragettli S and 9 others (2015) Unraveling the hydrology of a Himalayan catchment through integration of high resolution in situ data and remote sensing with an advanced simulation model. *Adv. Water Resour.*, **78**, 94–111 (doi: 10.1016/j.advwatres.2015.01.013)
- Rana B, Masayoshi N, Yutaka A, Kubota J and Kojima A (1998) Glacier Ablation under Debris cover: field observations on Lirung Glacier, Nepal Himalayas. *Proc. Int. Conf. Ecohydrol, High Mountain Areas*, International Centre for Integrated Mountain Development, Kathmandu, pp. 393–403
- Reddy SM, Searle MP and Massey JA (1993) Structural evolution of the High Himalayan Gneiss sequence, Langtang Valley, Nepal. *Geol. Soc. London, Spec. Publ.*, **74**(1), 375–389 (doi: 10.1144/GSL.SP.1993.074.01.25)
- Reid TD and Brock BW (2010) An energy-balance model for debris-covered glaciers including heat conduction through the debris layer. *J. Glaciol.*, **56**(199), 903–916 (doi: 10.3189/002214310794457218)
- Reid TD, Carenzo M, Pellicciotti F and Brock BW (2012) Including debris cover effects in a distributed model of glacier ablation. *J. Geophys. Res. Atmos.*, **117**(17), 1–15 (doi: 10.1029/2012JD017795)
- Reynolds JM (2000) On the formation of supraglacial lakes on debris-covered glaciers. *Debris-Covered Glaciers.*, IAHS Publication **264**, 153–161
- Reynolds J (2011) *An introduction to applied and environmental Geophysics*, 2nd edn. John Wiley & Sons, Chichester
- Reznichenko N, Davies T, Shulmeister J and McSaveney M (2010) Effects of debris on ice-surface melting rates: an experimental study. *J. Glaciol.*, **56**(197), 384–394 (doi: 10.3189/002214310792447725)
- Roth K, Schulien R, Flüchler H and Attinger W (1990) Calibration of time domain reflectometry for water content measurement using a composite dielectric approach. *Water Resour. Res.*, **26**(10), 2267–2273 (doi: 10.1029/WR026i010p02267)
- Rounce DR and McKinney DC (2014) Debris thickness of glaciers in the Everest Area (Nepal Himalaya) derived from satellite imagery using a nonlinear energy balance model. *Cryosphere*, **8**(1), 1317–1329 (doi: 10.5194/tcd-8-887-2014)
- Rounce DR, Quincey DJ and McKinney DC (2015) Debris-covered glacier energy balance model for Imja-Lhotse Shar Glacier in the Everest region of Nepal. *Cryosphere*, **9**(6), 2295–2310 (doi: 10.5194/tc-9-2295-2015)
- Sakai A, Takeuchi N, Fujita K and Nakawo M (2000) Role of supraglacial ponds in the ablation process of a debris-covered glacier in the Nepal Himalayas. *Debris-Covered Glaciers.*, IAHS Publication **264**, 119–130
- Sasaki O, Noguchi O, Zhang Y, Hirabayashi Y and Kanae S (2016) A global high-resolution map of debris on glaciers derived from multi-temporal ASTER images. *Cryosph. Discuss.*, 1–24 (doi: 10.5194/tc-2016-222)
- Sass O (2006) Determination of the internal structure of alpine talus deposits using different geophysical methods (Lechtaler Alps, Austria). *Geomorphology*, **80**(1), 45–58 (doi: 10.1016/j.geomorph.2005.09.006)
- Sass O and Wollny K (2001) Investigations regarding Alpine talus slopes using ground-penetrating radar (GPR) in the Bavarian Alps, Germany. *Earth Surf. Process. Landforms*, **26**(10), 1071–1086 (doi: 10.1002/esp.254)
- Schauwecker S and 7 others (2015) Remotely sensed debris thickness mapping of Bara Shigri Glacier, Indian Himalaya. *J. Glaciol.*, **61**(228), 675–688 (doi: 10.3189/2015JoG14J102)
- Scherler D, Bookhagen B and Strecker MR (2011) Spatially variable response of Himalayan glaciers to climate change affected by debris cover. *Nat. Geosci.*, **4**(3), 156–159 (doi: 10.1038/ngeo1068)
- Sensors and Software (1999) Technical manual 24. pulseEKKO 1000 RUN. User's guide v1.2. Ontario
- Sinisalo AGrinsted A, Moore JC, Kärkäs E and Pettersson R (2003) Snow-accumulation studies in Antarctica with ground-penetrating radar using 50, 100 and 800 MHz antenna frequencies. *Ann. Glaciol.*, **37**, 194–198 (doi: 10.3189/172756403781815825)
- Steiner JF and 5 others (2015) Modelling ice-cliff backwasting on a debris-covered glacier in the Nepalese Himalaya. *J. Glaciol.*, **61**(229), 889–907 (doi: 10.3189/2015JoG14J194)
- Tangborn W and Rana B (2000) Mass balance and runoff of the partially debris-covered Langtang Glacier, Nepal. *Debris-Covered Glaciers.*, IAHS Publication **264**, 99–108
- Wilson NJ, Flowers GE and Mingo L (2014) Mapping and interpretation of bed-reflection power from a surge-type polythermal glacier, Yukon, Canada. *Ann. Glaciol.*, **55**(67), 1–8 (doi: 10.3189/2014AoG67A101)
- Woodward J and Burke M (2007) Applications of GPR to glacial and frozen materials. *J. Environ. Eng. Geophys.*, **12**(1), 1–17 (doi: 10.2113/JEEG12.1.69)
- Wu Z and Liu SY (2012) Imaging the debris internal structure and estimating the effect of debris layer on ablation of Glacier ice. *J. Geol. Soc. India*, **80**(6), 825–835 (doi: 10.1007/s12594-012-0211-z)
- Yilmaz Ö (2001) *Seismic data analysis*. Society of Exploration Geophysicists, Tulsa
- Zhang Y, Fujita K, Liu S, Liu Q and Nuimura T (2011) Distribution of debris thickness and its effect on ice melt at Hailuoguo glacier, southeastern Tibetan Plateau, using in situ surveys and ASTER imagery. *J. Glaciol.*, **57**(206), 1147–1157 (doi: 10.3189/002214311798843331)

MS received 2 September 2016 and accepted in revised form 6 March 2017